```
[student559 10@bigdataanalytics-worker-3 ~]$ /opt/spark-2.4.8/bin/pyspark --packages org.apache.spark-spark-sql-kafka-0-10 2.11:2.4.5
Python 2.7.5 (default, Nov 16 2020, 22:23:17)
[GCC 4.8.5 20150623 (Red Hat 4.8.5-44)] on linux2
Type "help", "copyright", "credits" or "license" for more information.

Ivy Default Cache set to: /home/student559_10/.ivy2/cache
The jars for the packages stored in: /home/student559_10/.ivy2/jars
:: loading settings :: url = jar:file:/opt/spark-2.4.8/jars/ivy-2.4.0.jar!/org/apache/ivy/core/settings/ivysettings.xml
org.apache.spark#spark-sql-kafka-0-10 2.11 added as a dependency
:: resolving dependencies :: org.apache.spark#spark-submit-parent-69642e6c-602e-4b8b-b796-03f82d9307bd;1.0
        confs: [default]
         found org.apache.spark#spark-sgl-kafka-0-10 2.11:2.4.5 in central
         found org.apache.kafka#kafka-clients;2.0.0 in central
         found org.lz4#lz4-java;1.4.0 in central
         found org.xerial.snappy#snappy-java;1.1.7.3 in central
         found org.slf4j#slf4j-api;1.7.16 in central
         found org.spark-project.spark#unused;1.0.0 in central
downloading https://repoi.mayen.org/mayen2/org/apache/spark/spark-sql-kafka-0-10 2.11/2.4.5/spark-sql-kafka-0-10 2.11-2.4.5.jar ...
[SUCCESSFUL ] org.apache.spark#spark-sql-kafka-0-10_2.11;2.4.5!spark-sql-kafka-0-10_2.11.jar (118ms) downloading https://repo1.maven.org/maven2/org/apache/kafka/kafka-clients/2.0.0/kafka-clients-2.0.0.jar ...
        [SUCCESSFUL ] org.apache.kafka#kafka-clients;2.0.0!kafka-clients.jar (116ms)
downloading https://repoi.maven.org/maven2/org/lz4/lz4-java/1.4.0/lz4-java-1.4.0.jar ...
        [SUCCESSFUL ] org.lz4#lz4-java;1.4.0!lz4-java.jar (53ms)
downloading https://repoi.maven.org/maven2/org/xerial/snappy/snappy-java/1.1.7.3/snappy-java-1.1.7.3.jar ...
        [SUCCESSFUL ] org.xerial.snappy#snappy-java;1.1.7.3!snappy-java.jar(bundle) (107ms)
:: resolution report :: resolve 4564ms :: artifacts dl 400ms
        :: modules in use:
        org.apache.kafka#kafka-clients;2.0.0 from central in [default]
        org.apache.spark#spark-sql-kafka-0-10 2.11;2.4.5 from central in [default]
        org.lz4#lz4-java;1.4.0 from central in [default]
        org.slf4j#slf4j-api;1.7.16 from central in [default]
        org.spark-project.spark#unused;1.0.0 from central in [default]
        org.xerial.snappy#snappy-java;1.1.7.3 from central in [default]
                 | modules || artifacts |
                conf number| search|dwnlded|evicted | number|dwnlded|
         | default | 6 | 4 | 4 | 0 || 6 | 4 |
:: retrieving :: org.apache.spark#spark-submit-parent-69642e6c-602e-4b8b-b796-03f82d9307bd
        confs: [default]
        4 artifacts copied, 2 already retrieved (4706kB/19ms)
22/01/29 21:09:25 WARN util.NativeCodeLoader: Unable to load native-hadoop library for your platform... using builtin-java classes wher
Setting default log level to "WARN".
To adjust logging level use sc.setLogLevel(newLevel). For SparkR, use setLogLevel(newLevel).
22/01/29 21:09:26 WARN util.Utils: Service 'SparkUI' could not bind on port 4040. Attempting port 4041.
Welcome to
Using Python version 2.7.5 (default, Nov 16 2020 22:23:17)
SparkSession available as 'spark'.
```

```
>>> raw_data = spark.readStream. \
... format("kafka"). \
... option("kafka.bootstrap.servers", kafka_brokers).
... option("subscribe", "test_lesson_3_sapr"). \
... option("startingOffsets", "earliest"). \
... option("maxOffsetsPerTrigger", "5"). \
... load()
```

```
>>> schema = StructType() \
        .add("sepalLength", FloatType()) \
        .add("sepalWidth", FloatType()) \
        .add("petalLength", FloatType()) \
        .add("petalWidth", FloatType()) \
        .add("species", StringType())
. . .
>>>
>>> parsed iris = raw data \
        .select(F.from json(F.col("value").cast("String"), schema).alias("value"), "offset") \
        .select("value.*", "offset")
>>> raw data.printSchema()
root
 -- key: binary (nullable = true)
 -- value: binary (nullable = true)
 -- topic: string (nullable = true)
  -- partition: integer (nullable = true)
 -- offset: long (nullable = true)
 -- timestamp: timestamp (nullable = true)
 -- timestampType: integer (nullable = true)
>>> parsed iris.printSchema()
root
  -- sepalLength: float (nullable = true)
  -- sepalWidth: float (nullable = true)
  -- petalLength: float (nullable = true)
 -- petalWidth: float (nullable = true)
 -- species: string (nullable = true)
  -- offset: long (nullable = true)
>>>
```

```
>>> out = console_output(parsed_iris, 15)
22/01/29 21:34:00 WARN shortcircuit.DomainSocketFactory: The short-circuit
e libhadoop cannot be loaded.
Batch: 0
 |sepalLength|sepalWidth|petalLength|petalWidth|species|offset|
 Inull
             Inull
                       Inull
                                   Inull
                                              Inull
                                                      lΘ
 5.1
             3.5
                        1.4
                                    0.2
                                               setosa | 1
 4.9
             3.0
                                   0.2
                        1.4
                                               setosa |2
                       1.3
                                              setosa 3
 4.7
             3.2
                                    0.2
 4.6
                                   0.2
                       1.5
                                              setosa 4
             3.1
Batch: 1
 |sepalLength|sepalWidth|petalLength|petalWidth|species|offset|
 |5.0
             3.6
                        1.4
                                    0.2
                                               setosa |5
 5.4
                        1.7
                                              setosa 6
             3.9
                                    0.4
                                   0.3
 4.6
             3.4
                        1.4
                                               setosa 17
 5.0
                                    0.2
             3.4
                        1.5
                                               setosa |8
 4.4
                                   0.2
             2.9
                        1.4
                                               setosa | 9
out.stop()
>>> out.stop()
>>>
```

```
>>> def memory_sink(df, freq):
        return df.writeStream.format("memory") \
            .queryName("my_memory_sink_table") \
            .trigger(processingTime='%s seconds' % freq ) \
            .start()
. . .
>>> stream = memory sink(parsed iris, 5)
>>> spark.sql("select * from my_memory_sink_table").show()
|sepalLength|sepalWidth|petalLength|petalWidth|species|offset|
       null
                  null
                               null
                                          null
                                                  null
        5.1
                    3.5
                                1.4
                                           0.2
                                                setosa
                                                            2
3
4
        4.9
                    3.0
                                           0.2 setosa
                                1.4
        4.7
                    3.2
                                1.3
                                           0.2 setosa
        4.6
                    3.1
                                1.5
                                           0.2 setosa
                                                            5
         5.0
                    3.6
                                1.4
                                           0.2
                                                setosa
         5.4
                                                            6
                    3.9
                                1.7
                                           0.4 setosa
         4.6
                    3.4
                                1.4
                                           0.3 setosa
                                                            7
                                                            8
         5.0
                    3.4
                                1.5
                                           0.2 setosa
                                                            9
         4.4
                    2.9
                                1.4
                                           0.2 setosa
        4.9
                    3.1
                                1.5
                                           0.1 setosa
                                                           10
                    3.7
                                1.5
                                           0.2
                                                           11
         5.41
                                                setosa
                                                           12
         4.8
                    3.4
                                1.6
                                           0.2
                                                setosa
        4.8
                    3.0
                                1.4
                                                           13
                                           0.1 setosa
        4.3
                    3.0
                                1.1
                                                           14
                                           0.1 setosa
                                                           15
        5.8
                    4.0
                                1.2
                                           0.2 setosa
        5.7
                                1.5
                    4.4
                                           0.4 setosa
                                                           16
        5.4
                    3.9
                                1.3
                                                           17
                                           0.4 setosa
         5.1
                    3.5
                                1.4
                                           0.3
                                                setosa
                                                           18
                                                           19
         5.7
                    3.8
                                1.7
                                           0.3 setosa
only showing top 20 rows
>>>
```

```
>>> spark.sql("select count(*) from my_memory_sink_table").show()
|count(1)|
       25|
>>> spark.sql("select count(*) from my_memory_sink_table").show()
|count(1)|
+----+
       30|
>>> spark.sql("select count(*) from my_memory_sink_table").show()
|count(1)|
       30|
>>> spark.sql("select count(*) from my_memory_sink_table").show()
|count(1)|
       35|
>>> stream.stop()
>>>
                                               S 5. 37.139.41.176 (student559_10)
```

```
Found 4 items

drwxr-xr-x - student559_10 student559_10 0 2022-01-28 23:15 .sparkStaging

drwxr-xr-x - student559_10 student559_10 0 2022-01-28 14:11 for_stream

drwxr-xr-x - student559_10 student559_10 0 2022-01-29 21:57 iris_file_checkpoint

drwxr-xr-x - student559_10 student559_10 0 2022-01-29 21:57 my_parquet_sink

[student559_10@bigdataanalytics-worker-3 ~]$
```

```
[student559 10@bigdataanalytics-worker-3 ~]$ hdfs dfs -ls my parquet sink
Found 32 items
drwxr-xr-x - student559 10 student559 10
                                                    0 2022-01-29 21:59 my parquet sink/ spark metadata
             2 student559 10 student559 10
                                                 1702 2022-01-29 21:57 my parquet sink/part-00000-008d4b1
e-2daf-44b3-be05-44a9e029b07a-c000.snappy.parquet
             2 student559 10 student559 10
                                                 1734 2022-01-29 21:59 my_parquet_sink/part-00000-06a403f
8-1f9e-483f-b9cf-3e4e3337c8e8-c000.snappy.parquet
             2 student559 10 student559 10
                                                 1735 2022-01-29 21:59 my parquet sink/part-00000-0ff931c
2-2de2-4b32-8bbe-53d63953eb27-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1708 2022-01-29 21:59 my parquet sink/part-00000-12bfc9f
9-25df-4c78-b252-0c2e5e000e78-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1780 2022-01-29 21:58 my parquet sink/part-00000-159c13a
f-e38d-4756-93b0-35c3c677e2ba-c000.snappy.parquet
      -r-- 2 student559 10 student559 10
                                                 1744 2022-01-29 21:57 my parquet sink/part-00000-18c562c
5-9745-4b12-a78c-49d756fa1a45-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1748 2022-01-29 21:59 my parquet sink/part-00000-1a255af
6-a55a-4576-a9e2-d3cbfefb0cf2-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1744 2022-01-29 21:58 my parquet sink/part-00000-298ce55
c-5dcd-4f7e-b774-2f1f7b42a006-c000.snappy.parquet
-rw-r--r-- 2 student559 10 student559 10
                                                 1762 2022-01-29 21:58 my parquet sink/part-00000-32de69f
a-9ace-4edf-88fe-260e7fa61e0a-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1726 2022-01-29 21:58 my parquet sink/part-00000-4169eea
7-f9ba-4da9-95d9-c621c6e6bd07-c000.snappy.parguet
-rw-r--r-- 2 student559 10 student5<u>59</u> 10
                                                 1735 2022-01-29 21:59 my parquet sink/part-00000-422bee9
5-994e-4d61-b559-0900e03ff711-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1735 2022-01-29 21:59 my parquet sink/part-00000-453f0d2
2-68fd-44ad-a862-373160962297-c000.snappy.parquet
-rw-r--r-- 2 student559 10 student559 10
                                                 1753 2022-01-29 21:59 my parquet sink/part-00000-471c434
6-24b1-465a-9de5-820855a2cf38-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1762 2022-01-29 21:58 my parquet sink/part-00000-473e526
3-67e4-47b3-909a-2c66f9622892-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1762 2022-01-29 21:58 my parquet sink/part-00000-5310fa6
4-348d-4d01-8c17-0fc4838de416-c000.snappy.parquet
-rw-r--r-- 2 student559 10 student559 10
                                                 1720 2022-01-29 21:57 my parquet sink/part-00000-5a05ad4
c-aebe-4954-8f0e-65158260311f-c000.snappy.parquet
            2 student559 10 student559 10
                                                 1753 2022-01-29 21:59 my parquet sink/part-00000-5e231f0
6-26fc-4fe8-9cc9-5109843408e5-c000.snappy.parquet
-rw-r--r-- 2 student559 10 student559 10
                                                 1735 2022-01-29 21:59 my_parquet_sink/part-00000-65b3025
1-0243-4fa7-ac26-4b9ce3f106b9-c000.snappy.parquet
-rw-r--r-- 2 student559 10 student559 10
                                                 1741 2022-01-29 21:58 my parquet sink/part-00000-68c1c92
```

```
[student559_10@bigdataanalytics-worker-3 ~]$ hdfs dfs -df -h my_parquet_sink
Filesystem Size Used Available Use%
hdfs://bigdataanalytics-head-0.mcs.local:8020 35.4 G 14.7 G 16.1 G 42%
[student559_10@bigdataanalytics-worker-3 ~]$
```

Kafka

```
Using Python version 2.7.5 (default, Nov 16 2020 22:23:17)

SparkSession available as 'spark'.

>>> from pyspark.sql import functions as F

>>> from pyspark.sql.types import *

>>> kafka_brokers = "bigdataanalytics-worker-3:6667"

>>> def kafka_sink(df, freq):

... return df.selectExpr("CAST(null AS STRING) as key", "CAST(struct(*) AS STRING) as value") \

... .writeStream \

... .format("kafka") \

... .trigger(processingTime='%s seconds' % freq ) \

... .option("topic", "shadrin_iris_sink") \

... .option("kafka.bootstrap.servers", kafka_brokers) \

... .option("checkpointLocation", "shadrin_iris_kafka_checkpoint") \

... .start()

...

>>> ■
```

```
[student559_10@bigdataanalytics-worker-3 ~]$ /usr/hdp/current/kafka-broker/bin/kafka-console-consum
--topic test iris sink --from-beginning --bootstrap-server bigdataanalytics-worker-3:6667
[5.4, 3.4, 1.7, 0.2, setosa, 21]
[5.1, 3.3, 1.7, 0.5, setosa, 24]
[5.0, 3.4, 1.6, 0.4, setosa, 27]
[4.7, 3.2, 1.6, 0.2, setosa, 30]
[5.2, 4.1, 1.5, 0.1, setosa, 33]
[5.1, 3.7, 1.5, 0.4, setosa, 22]
[4.8, 3.4, 1.9, 0.2, setosa, 25]
[5.2, 3.5, 1.5, 0.2, setosa, 28]
[4.8, 3.1, 1.6, 0.2, setosa, 31]
[5.5, 4.2, 1.4, 0.2, setosa, 34]
[5.1, 3.8, 1.5, 0.3, setosa, 20]
[4.6, 3.6, 1.0, 0.2, setosa, 23]
[5.0, 3.0, 1.6, 0.2, setosa, 26]
[5.2, 3.4, 1.4, 0.2, setosa, 29]
[5.4, 3.4, 1.5, 0.4, setosa, 32]
```

```
>>> det katka sink json(dt, treq):
        return df.selectExpr("CAST(null AS STRING) as key", "CAST(to json(struct(*)) AS STRING) as value
") \
            .writeStream \
. . .
            .format("kafka") \
. . .
            .trigger(processingTime='%s seconds' % freq ) \
. . .
            .option("topic", "test_iris_sink") \
            .option("kafka.bootstrap.servers", kafka_brokers) \
            .option("checkpointLocation", "shadrin iris kafka checkpoint") \
. . .
            .start()
. . .
>>> stream = kafka sink json(parsed iris, 5)
>>> stream.stop()
>>>
```

```
[student559_10@bigdataanalytics-worker-3_bin]$_/usr/hdp/current/kafka-broker/bin/kafka-console-consumer.
h --bootstrap-server bigdataanalytics-worker-3:6667 --from-beginning --topic test iris sink
 "sepalLength":4.9, "sepalWidth":3.0, "petalLength":1.4, "petalWidth":0.2, "species": "setosa", "offset":2}
 "sepalLength":5.0, "sepalWidth":3.6, "petalLength":1.4, "petalWidth":0.2, "species": "setosa", "offset":5}
 "sepalLength":5.0, "sepalWidth":3.4, "petalLength":1.5, "petalWidth":0.2, "species": "setosa", "offset":8
 "sepalLength":5.4, "sepalWidth":3.7, "petalLength":1.5, "petalWidth":0.2, "species": "setosa", "offset":11}
 "sepalLength":4.3, "sepalWidth":3.0, "petalLength":1.1, "petalWidth":0.1, "species": "setosa", "offset":14}
 sepalLength":5.4,"sepalWidth":3.9,"petalLength":1.3,"petalWidth":0.4,"species":"setosa","offset":17
 "sepalLength":5.1, "sepalWidth":3.8, "petalLength":1.5, "petalWidth":0.3, "species": "setosa", "offset":20}
 "sepalLength":4.6."sepalWidth":3.6,"petalLength":1.0,"petalWidth":0.2,"species":"setosa","offset":23
 "sepalLength":5.0."sepalWidth":3.0."petalLength":1.6."petalWidth":0.2."species":"setosa"."offset":26
 "sepalLength":5.2, "sepalWidth":3.4, "petalLength":1.4, "petalWidth":0.2, "species": "setosa", "offset":29}
 "sepalLength":5.4, "sepalWidth":3.4, "petalLength":1.5, "petalWidth":0.4, "species": "setosa", "offset":32}
 "sepalLength":4.9,"sepalWidth":3.1,"petalLength":1.5,"petalWidth":0.2,"species":"setosa","offset":35}
 "sepalLength":4.9, "sepalWidth":3.6, "petalLength":1.4, "petalWidth":0.1, "species": "setosa", "offset":38}
 "sepalLength":5.0, "sepalWidth":3.5, "petalLength":1.3, "petalWidth":0.3, "species": "setosa", "offset":41}
 "sepalLength":5.0,"sepalWidth":3.5,"petalLength":1.6,"petalWidth":0.6,"species":"setosa","offset":44}
 sepalLength":5.1,"sepalWidth":3.8,"petalLength":1.6,"petalWidth":0.2,"species":"setosa","offset":47!
 "sepalLength":5.0,"sepalWidth":3.3,"petalLength":1.4,"petalWidth":0.2,"species":"setosa","offset":50
 sepallength":6.9,"sepalWidth":3.1,"petalLength":4.9,"petalWidth":1.5,"species":"versicolor","offset":5"
 "sepalLength":5.1, "sepalWidth":3.5, "petalLength":1.4, "petalWidth":0.2, "species": "setosa", "offset":1
 "sepalLength":4.6,"sepalWidth":3.1,"petalLength":1.5,"petalWidth":0.2,"species":"setosa","offset":4}
 sepalLength":4.6."sepalWidth":3.4."petalLength":1.4."petalWidth":0.3."species":"setosa","offset":7!
 sepalLength":4.9."sepalWidth":3.1."petalLength":1.5."petalWidth":0.1."species":"setosa"."offset":10!"
 "sepalLength":4.8,"sepalWidth":3.0,"petalLength":1.4,"petalWidth":0.1,"species":"setosa","offset":13
 sepalLength":5.7,"sepalWidth":4.4,"petalLength":1.5,"petalWidth":0.4,"species":"setosa","offset":16"
 "sepalLength":5.7."sepalWidth":3.8."petalLength":1.7."petalWidth":0.3."species":"setosa"."offset":19
 sepalLength":5.1,"sepalWidth":3.7,"petalLength":1.5,"petalWidth":0.4,"species":"setosa","offset":22!
 sepalLength":4.8,"sepalWidth":3.4,"petalLength":1.9,"petalWidth":0.2,"species":"setosa","offset":25?
 sepalLength":5.2."sepalWidth":3.5."petalLength":1.5."petalWidth":0.2."species":"setosa"."offset":28!
 "sepalLength":4.8, "sepalWidth":3.1, "petalLength":1.6, "petalWidth":0.2, "species": "setosa", "offset":31}
 sepalLength":5.5,"sepalWidth":4.2,"petalLength":1.4,"petalWidth":0.2,"species":"setosa","offset":34}"
 "sepalLength":5.5, "sepalWidth":3.5, "petalLength":1.3, "petalWidth":0.2, "species": "setosa", "offset":37}
 sepalLength":5.1."sepalWidth":3.4."petalLength":1.5."petalWidth":0.2."species":"setosa"."offset":40?"
f"senall ength": 4 4 "senal width": 2 2 "netall ength": 1 2 "netal width": 0 2 "snecies": "setesa" "offset": 42
```

```
>>> extended_iris = parsed_iris.withColumn("my_current_time", F.current_timestamp())
>>> extended_iris.printSchema()
root
    |-- sepalLength: float (nullable = true)
    |-- sepalWidth: float (nullable = true)
    |-- petalLength: float (nullable = true)
    |-- petalWidth: float (nullable = true)
    |-- species: string (nullable = true)
    |-- offset: long (nullable = true)
    |-- my_current_time: timestamp (nullable = false)
>>> ■
```

```
>>> def foreach batch sink(df, freq):
        return df \
            .writeStream \
            .foreachBatch(foreach batch function) \
            .trigger(processingTime='%s seconds' % freq ) \
. . .
            .start()
>>> stream = foreach batch sink(extended iris, 5)
Traceback (most recent call last):
 File "<stdin>", line 1, in <module>
 File "<stdin>", line 4, in foreach_batch_sink
NameError: global name 'foreach batch function' is not defined
>>>
>>> def foreach batch function(df, epoch id):
        print("starting epoch " + str(epoch id) )
. . .
        print("average values for batch:")
. . .
        df.groupBy("species").avg().show()
. . .
        print("finishing epoch " + str(epoch id))
```

```
>>> stream = foreach batch sink(extended iris, 5)
>>> starting epoch 0
average values for batch:
|species| avg(sepalLength)| avg(sepalWidth)| avg(petalLength)| avg(petalWidth)|avg(offset)|
null| null| null| 0.0|
| setosa|4.824999928474426|3.199999988079071|1.399999976158142|0.20000000298023224| 2.5|
+-----+
finishing epoch 0
22/01/31 10:19:23 WARN streaming.ProcessingTimeExecutor: Current batch is falling behind. The trigger in
terval is 5000 milliseconds, but spent 6062 milliseconds,
starting epoch 1
average values for batch:
+-----+-----+-----+-----+------+------+
|species| avg(sepalLength)| avg(sepalWidth)| avg(petalLength)| avg(petalWidth)|avg(offset)|
t-----t-----t-----t-----t------t
 setosa|4.880000019073487|3.440000057220459|1.4799999952316285|0.26000000536441803|
 ------
finishing epoch 1
starting epoch 2
average values for batch:
|species| avg(sepalLength)| avg(sepalWidth)| avg(petalLength)| avg(petalWidth)|avg(offset)|
 setosa|4.840000152587891|3.240000009536743|1.4200000047683716|0.14000000208616256|
finishing epoch 2
starting epoch 3
average values for batch:
|species| avg(sepalLength)| avg(sepalWidth)| avg(petalLength)| avg(petalWidth)|avg(offset)|
finishing epoch 3
```